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14 Classes*

15 **UNITED STATES DISTRICT COURT
NORTHERN DISTRICT OF CALIFORNIA
SAN JOSE DIVISION**

16 JOHN DOE I and JOHN DOE II, on behalf
17 of themselves and all others similarly
situated,

18 Plaintiffs,

19 v.

20 GOOGLE LLC,

21 Defendant.

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24 Case No. 5:23-cv-02431-BLF

25 **DECLARATION OF DR. ZUBAIR SHAFIQ
IN SUPPORT OF PLAINTIFFS' MOTION
FOR PRELIMINARY INJUNCTION AND
PROVISIONAL CLASS CERTIFICATION**

26 Date: November 2, 2023

27 Time: 9:00 A.M.

28 Judge: Hon. Beth Labson Freeman

DECLARATION OF DR. ZUBAIR SHAFIQ

I, ZUBAIR SHAFIQ, hereby declare under penalty of perjury:

1. I am an associate professor of computer science at University of California, Davis, where I teach, conduct research and analyze issues involving Internet privacy, security, and performance, using network measurement and machine learning techniques.

2. I have been retained by Plaintiffs' counsel and submit this declaration in support of Plaintiffs' Motion for Preliminary Injunction.

3. I have personal knowledge of the facts set forth herein and, if called as a witness, could and would testify competently to them.

4. I reserve the right to modify, supplement or otherwise amend my statements, analyses, and conclusions in this declaration should new and additional information become available to me.

I. QUALIFICATIONS

1. I am an associate professor of computer science at University of California, Davis, where I run a lab and conduct research that focuses on Internet privacy, security, and performance, using network measurement and machine learning techniques. In particular, my research over the last several years has specifically aimed to uncover personal data collection, sharing, and usage in the online advertising ecosystem. In addition to my lab and research work, I regularly teach undergraduate and graduate courses on computer networks and computer security, including special topics courses covering emerging trends in online advertising and tracking.

2. I have co-authored nearly 100 peer-reviewed research papers, and have received several awards and distinctions for my research. Notably, I was the recipient of the 2018 Andreas Pfitzmann Award at the flagship Privacy Enhancing Technologies Symposium for my research on designing a system to reliably detect advertising and tracking information flows in mobile apps. I also received the Best Paper Award at the 2017 ACM Internet Measurement Conference for my research on exposing and investigating the abuse of a security vulnerability in Facebook Graph API's implementation of 3rd party apps. I also received the Best Paper Award at the 2012 IEEE

1 International Conference on Network Protocols for my research on reverse engineering proprietary
2 network protocols through network traffic analysis.

3 3. My full qualifications are set forth in my curriculum vitae, which is attached as
4 Exhibit A.

5 4. I have been retained by counsel for Plaintiffs as an expert in this matter and submit
6 this declaration in support of Plaintiffs' Motion for Preliminary Injunction.

7 5. I reserve the right to amend, modify, or supplement my opinions as new or additional
8 information becomes available to me

9 **II. ASSIGNMENT AND SUMMARY OF CONCLUSIONS**

10 6. I have been asked to conduct entropy analysis to determine whether the information
11 obtained by Google source code – specifically Google Analytics, Google Ads, and Google Display
12 Ads – may be considered personally identifiable information (PII) about patients on health care
13 related websites and apps. Based on my analysis of the information collected, my conclusion is yes.
14 As I explain below, the information collected by Google far exceeds a critical amount of user-
15 identifying entropy. The information collected by Google allows it to identify patients uniquely and
16 persistently on health care related websites and apps.

17 7. I have been asked to analyze whether a data company, like Google, can readily
18 identify health care related websites and apps. My conclusion is yes. Data companies, like Google,
19 should have the systems and tools in place to identify website and app content. In the case of
20 Google, I am aware that Google does indeed have specific tools that can do this work. Based on
21 my experience and expertise, as well as my analysis of various tools available to data companies,
22 it is my opinion that Google can identify health care related websites and apps using its own
23 Verticals taxonomy and content classification API, as well as off-the-shelf content classification
24 services.

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1 **III. OVERVIEW OF ENTROPY**

2 8. The scientific community has widely adopted entropy as a metric to quantify privacy
 3 risk of identifiability of an individual.¹ Entropy is measured in terms of bits. If the number of
 4 entropy bits for a piece of data – either alone or combined with other information – exceed a certain
 5 threshold, then the concept of entropy concludes that the data can be used to uniquely (re)identify
 6 users.

7 9. Google itself uses entropy to quantify privacy risk. For example, Google’s Privacy
 8 Sandbox project uses entropy to determine “Privacy Budget.”² Outside of Google, the privacy non-
 9 profit public interest group Electronic Frontier Foundation³ and the Mozilla⁴ browser also used
 10 entropy as a metric to assess identifiability of information.

11 10. Google Chrome uses entropy to label APIs “that exposes data that folks on the
 12 internet find useful for fingerprinting”. “Attributes and methods marked as [HighEntropy] are

19 ¹ Note that dozens of privacy metrics and analysis techniques have been proposed in the scientific
 20 community over the past few decades. The following paper by Wagner and Eckhoff – that surveys
 21 more than 80 privacy metrics – explains that most of these metrics either directly build on entropy
 22 or are indirectly related to entropy. For this reason, and – as explained below – because Google
 23 also extensively uses entropy for privacy assessment, I use entropy for privacy analysis. However,
 the same conclusion can be reached if other privacy metrics are suitably used to analyze the
 information collected by the Google Source Code – specifically Google Analytics, Google Ads,
 and Google Displays Ads.

24 Wagner, I. and Eckhoff, D., 2018. Technical privacy metrics: a systematic survey. ACM
 Computing Surveys, 51(3).

25 ² Privacy Budget: Limit the amount of individual user data exposed to sites to prevent covert
 26 tracking. <https://developer.chrome.com/en/docs/privacy-sandbox/privacy-budget/>

27 ³ A Primer on Information Theory and Privacy <https://www.eff.org/deeplinks/2010/01/primer-information-theory-and-privacy>

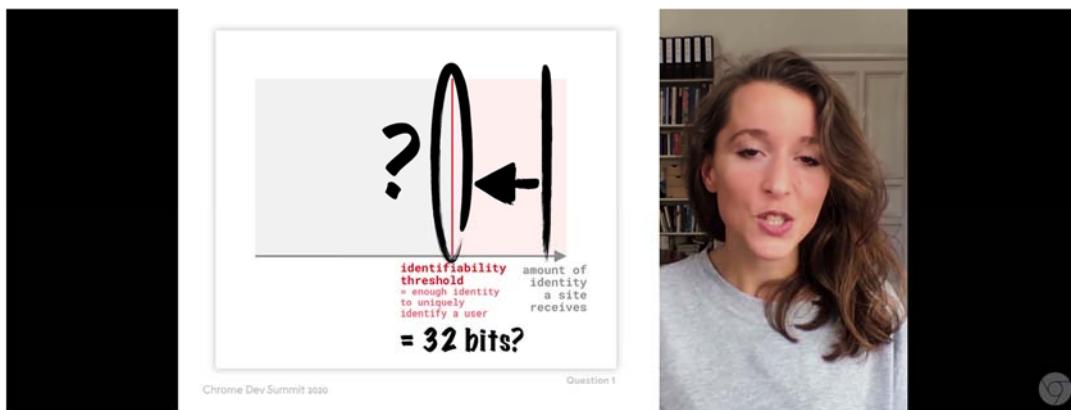
28 ⁴ Technical Comments on Privacy Budget <https://mozilla.github.io/ppa-docs/privacy-budget.pdf>

1 known to be practically useful for identifying particular clients on the web today.”⁵ See, for
 2 example⁶ (emphasis added):

3 `[HighEntropy=Direct, MeasureAs=NavigatorMaxTouchPoints] readonly attribute long maxTouchPoints;`
 4

5 11. The minimum amount of entropy required to uniquely identify a person in a population of size N is $\log_2(N)$. Given that Earth’s population is approximately 8 billion, the number of required bits is $\log_2(8 \text{ billion}) = 32.897 \approx 33$ bits. Given that the number of Internet users on Earth is ≈ 4 billion, the number of required entropy bits to uniquely identify a user or device on the Internet is $\log_2(4 \text{ billion}) = 31.897 \approx 32$ bits.⁷

10 12. Google itself uses 32 bits of entropy as the identifiability threshold. As shown in Figure 1, Google uses the 32 bits as the identifiability threshold⁸ in calculating its “Privacy Budget”. As another example, as shown in Figure 2, the FAQ page of Google’s Privacy Budget project justifies the use of the 32-bit entropy threshold for identifiability.⁹



21 **Figure 1: Google employee explains that the 32-bit identifiability threshold is enough
 22 to uniquely identify a user.**

23 _____
 24 ⁵ [https://chromium.googlesource.com/chromium/src/+main/third_party/blink/renderer/bindings/IDLExtendedAttributes.md#HighEntropy_m_a_c](https://chromium.googlesource.com/chromium/src/+/main/third_party/blink/renderer/bindings/IDLExtendedAttributes.md#HighEntropy_m_a_c)

25 ⁶ <https://source.chromium.org/search?q=HighEntropy%3DDirect&ss=chromium%2Fchromium%2Fsrc>

26 ⁷ <https://www.eff.org/deeplinks/2010/01/primer-information-theory-and-privacy>
 27 ⁸ Introducing the Privacy Budget <https://www.youtube.com/watch?v=0STgfjSA6T8&t=423s>
 28 ⁹ <https://github.com/mikewest/privacy-budget/blob/4e5f78adde92bd622dafcecae78682fc0823c0eb/faq.md>

1
2 **Is the privacy budget feasible?**
3 This proposal is at an early stage and exact privacy budget limits are to be determined. But there are reasons to think that a privacy budget
4 is feasible: it takes about **32 bits of entropy** to uniquely identify people on the web.
5 About these numbers:
6

- There are about **4.6 billion of web users**. So it takes $\log_2(4.6 \text{ billion}) =$ about 32 bits of entropy to uniquely identify people on the web.
- Mobile web users make up **most of web users**.

7 [Read more about entropy.](#)
8 FAQ Contributors: [maudnals](#), [jensenpaul](#), [asankah](#), [bslassey](#), [rowan-m](#).

7 **Figure 2: Google explains entropy and the 32-bit identifiability threshold.**

8 13. Thus, under the concept of entropy, individual pieces of data in a given transmission
9 are evaluated and assigned a value of bits. The bits are then totaled and if they exceed 32-bits then
10 that information combination is deemed to be identifiable within the scientific community.¹⁰

11 **IV. ANALYSIS**

12 14. To apply the entropy concept, I analyzed network transmissions from an
13 individual's web browser when they are communicating with a health care provider, for example,
14 MedStar Health. I then focus on the network transmissions that, in the course of the individual's
15 communication with MedStar, are also being made to Google via Google Analytics, Google Ads
16 and Google Displays Ads. Specifically, I look at the network transmissions that occur in the
17 following example: when loading the "Abdominal Aneurysm Treatment | MedStar Health"
18 webpage included in the Amended Complaint: <https://www.medstarhealth.org/services/abdominal-aneurysm-treatment>.

20 15. I found that Google collected at least the following four types of identifying
21 information from the patient's browser:¹¹

23 ¹⁰ A caveat to be aware of when calculating the "joint" entropy is that we should not simply sum
24 up entropy of different pieces of data if they are dependent with each other. If different pieces of
25 data are dependent, then the joint entropy could be lower than the simple sum of entropy of different
26 pieces of data. Thomas M. Cover; Joy A. Thomas. Elements of Information Theory. Wiley (2006)

27 ¹¹ I focus on these four types of information because, as discussed further below, they far exceed
28 the entropy threshold for identifiability. But, based on my experience, expertise, and review of
 network transmissions, there is additional information that is sent to Google, which may also
 contribute to the entropy threshold. For the sake of brevity, I do not analyze each and every piece
 of data transmitted but can do so if the Court so requires.

- a. IP address
- b. User agent
- c. Cookies, such as:¹²
 - i. _ga cookie used to distinguish patients with 2 years' expiration and exfiltrated via cid URL parameter;
 - ii. _gid cookie used to distinguish patients with 24 hours' expiration and exfiltrated via _gid URL parameter;
 - iii. _gcl_au cookie used for conversion tracking with 3 months' expiration and exfiltration via auiddc URL parameter;
 - iv. Third-party AEC cookie on google.com with session based expiration;
 - v. Third-party IDE cookie on doubleclick.net containing unique device identifier with 13 months' expiration;
 - vi. Third-party DSID cookie on doubleclick.net containing Google account identifier with 2 weeks' expiration; and
 - vii. Third-party NID cookie on google.com containing unique device identifier with 6 months' expiration.
- d. Device attributes, such as:
 - i. Screen resolution exfiltrated via sr URL parameter;
 - ii. Viewport size exfiltrated via vp URL parameter;
 - iii. Document encoding exfiltrated via de URL parameter;
 - iv. Screen color depth exfiltrated via sd URL parameter;
 - v. Language exfiltrated via ul URL parameter;
 - vi. Whether Java is enabled exfiltrated via je URL parameter;
 - vii. Device architecture exfiltrated via uaa URL parameter;
 - viii. Device bitness exfiltrated via uab URL parameter;

¹² I note that while the _ga, _gid, and _gcl_au cookies belong to Google (a third party to the communication between the individual and their health care provider), these three Google cookies nonetheless appear as "first-party" cookies. This makes it much more difficult for individuals to prevent the transmission of information to third-party Google.

- 1 ix. Whether the device is mobile exfiltrated via uamb URL parameter;
- 2 x. Device model exfiltrated via uam URL parameter;
- 3 xi. Device platform exfiltrated via uap URL parameter;
- 4 xii. Device platform version number exfiltrated via uapv URL parameter;
- 5 xiii. Whether Windows OS on Windows 64 bit is supported exfiltrated via
- 6 WOW64 parameter;
- 7 xiv. User agent full version list exfiltrated via uafvl URL parameter;
- 8 xv. Accepted encoding via Accept-Encoding header;
- 9 xvi. Accepted language via Accept-Language header;
- 10 xvii. Cache control via Cache-Control header; and
- 11 xviii. Which content types client is able to understand via Accept header.

12 16. Below I conduct entropy analysis of the aforementioned four types of identifying
 13 information collected by Google.

14 17. First, the IP address by itself is a sufficiently unique and persistent identifier to be
 15 classified as PII.

16 a. There are two prevalent IP protocols: IPv4 and IPv6. The length of IPv4 address is
 17 32 bits (i.e., \approx 4 billion possible IPv4 addresses). Note that IPv4 addresses are
 18 sometimes reused or shared across users (e.g., using a mechanism called Network
 19 Address Translation [NAT]). The new IPv6 protocol is now used by approximately
 20 one-half of Internet users in the United States.¹³ The length of IPv6 address is 128
 21 bits (i.e., \approx 340 trillion-trillion-trillion IP addresses possible IPv6 addresses). Thus,
 22 IP address, especially the newer IPv6 variant, is able to uniquely identify patients.

23 b. While IP addresses may not always be static (i.e., they can change), peer-reviewed
 24 research¹⁴ shows that the IP address by itself remains a serious threat to tracking
 25 despite the use of non-static IP addresses. Specifically, researchers showed that

26
 27 ¹³ <https://www.google.com/intl/en/ipv6/statistics.html>

28 ¹⁴ Don't Count Me Out: On the Relevance of IP Address in the Tracking Ecosystem
<https://dl.acm.org/doi/pdf/10.1145/3366423.3380161>

1 “87% of participants retain at least one IP address for more than a month”. For the
 2 study participants in the United States, the average IP address retention period was
 3 18.93 days. Thus, IP address is a persistent identifier.

4 18. Second, the user agent also contains a significant amount of entropy. There are
 5 approximately 10 bits of entropy in user agent. More specifically, 10.000 according to this EFF
 6 study¹⁵ and 9.779 bits according to this AmIUnique study.¹⁶ As discussed below, user agent when
 7 combined with other information collected by Google easily exceeds the 32-bit identifiability
 8 threshold.

9 19. Third, since arbitrary information can be stored in cookies, there is really no limit to
 10 how many bits of entropy (identifying information) can be stored in cookies. Google typically
 11 stores Universally Unique Identifier (UUID) in the aforementioned cookies.¹⁷ Assuming each
 12 character encodes up to 8 bits of information, the total entropy for the NID cookie alone would be
 13 211 characters x 8 bits = 1,688 bits. Similarly, each of the other identifier cookies listed above far
 14 exceeds the 32-bit identifiability threshold.

15 20. Fourth, the various device attributes collected by Google also contain sufficient
 16 entropy that can be combined¹⁸ with IP address and user agent to exceed the 32-bit identifiability
 17 threshold. For example, IP address (containing up to 32 bits for IPv4 and up to 128 bits for IPv6)
 18 and user agent (containing approximately 10 bits) can be combined with various device attributes:
 19 screen/viewport size and color depth (7.72 bits), screen resolution (4.89 bits), Accept-Language

20
 21
 22
 23 ¹⁵ Peter Eckersley. How unique is your web browser? International Symposium on Privacy
 Enhancing Technologies Symposium, pages 1–18. Springer, 2010.

24 ¹⁶ Pierre Laperdrix, Walter Rudametkin, and Benoit Baudry. Beauty and the beast: Diverting
 25 modern web browsers to build unique browser fingerprints. IEEE Symposium on Security and
 26 Privacy, pages 878–894. 2016.

27 ¹⁷ <https://developers.google.com/analytics/devguides/collection/protocol/v1/parameters#cid>

28 ¹⁸ While the overall entropy of a combination of fields cannot be computed by simply adding them
 up if they are not independent as I discussed above, there is clear sufficient entropy together in
 these fields such that the joint entropy easily surpasses the 32-bit identifiability threshold.

1 (5.918 bits), Accept-Encoding (1.53 bits), Device platform (2.31 bits), Accept (2.21 bits), and
 2 whether device is mobile (0.68 bits) to exceed the 32 bit identifiability threshold.^{19,20}

3 21. In summary, the various pieces of information collected by Google Analytics,
 4 Google Ads, and Google Displays Ads far exceeds the 32-bits entropy identifiability threshold. My
 5 conservative analysis shows that the information collected by Google allows it to identify
 6 individuals uniquely and persistently on health care related websites and apps.

7 **V. HEALTH CARE CONTENT CLASSIFICATION**

8 22. Google provides advertisers a well-known “Verticals” taxonomy²¹ to target content
 9 of various categories. These include at least 89 specific “/Health” related verticals such as
 10 “/Health/Health Conditions/Cancer” and “/Health/Health Conditions/AIDS & HIV”.

11 23. It is my opinion that Google possesses the technology to use its taxonomies to
 12 classify content on health care related websites and apps. Google’s initial claim to fame was its
 13 search engine that is based on “processing and analyzing the textual content and key content tags
 14 and attributes”.²²

15 24. Based on my experience and expertise, it is my opinion that Google can likely easily
 16 identify health care related websites and apps using this content classification technology. In fact,
 17 Google publicly provides a “content categories” classification API²³ that it can use to identify health
 18 care related websites and apps, including those that are classified into verticals such as
 19 “/Health/Health Conditions/Cancer” and “/Health/Health Conditions/AIDS & HIV”.

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¹⁹ <https://coveryourtracks.eff.org/>

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²⁰ Pierre Laperdrix, Walter Rudametkin, and Benoit Baudry. 2016. Beauty and the beast: Diverting modern web browsers to build unique browser fingerprints. 37th IEEE Symposium on Security and Privacy.

26

²¹ <https://developers.google.com/adwords/api/docs/appendix/verticals>

27

²² <https://developers.google.com/search/docs/fundamentals/how-search-works>

28

²³ Cloud Natural Language API <https://cloud.google.com/natural-language/docs/categories>

1 25. In addition, I am aware of several off-the-shelf content classification services (e.g.,
2 WebShrinker²⁴, RapidAPI²⁵, Klazify²⁶) that Google and anyone else can use to identify health care
3 related websites and apps. These services are available for free (but rate and quota limited) or can
4 be obtained at a reasonable cost (e.g., \$100 per month for 30 million content classification
5 decisions²⁷).

* * *

I declare under penalty of perjury under the laws of the United States of America that the foregoing is true and correct.

9 Executed this 12th day of June 2023 at Davis, California.

/s/ Zubair Shafiq

²⁴ Website Categories <https://docs.webshrinker.com/v3/iab-website-categories.html#tier-1-and-tier-2-categories>

²⁷ ²⁵ <https://rapidapi.com/ibmbpmtips/api/iab-taxonomy-text-classification/details>

²⁶ <https://www.klazify.com/>

²⁷ <https://rapidapi.com/ibmbpmtips/api/iab-taxonomy-text-classification/pricing>

EXHIBIT “A”

Zubair Shafiq

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Research Interests

Web Privacy, Internet Measurement, Internet Security, Computer Networks

Professional Experience

- 2020– **Associate Professor**
Department of Computer Science, University of California-Davis
- 2014–2020 **Assistant Professor**
Department of Computer Science, University of Iowa
- 2009–2014 **Research Assistant**
Department of Computer Science and Engineering, Michigan State University
- 2013 **Research Intern**
IBM T. J. Watson Research Center
- 2012 **Research Intern**
Telefonica Research
- 2011 **Research Intern**
AT&T Labs – Research
- 2007-2009 **Research Engineer**
Next Generation Intelligent Networks Research Center, Pakistan

Education

- 2009–2014 **Ph.D. Computer Science**
Department of Computer Science and Engineering, Michigan State University
- 2004–2008 **B.E. Electrical Engineering**
National University of Sciences & Technology (NUST), Pakistan

Honors and Awards

- 2023 **Chancellor's Fellow**, University of California Davis
- 2020 **Research Highlights**, Communications of the ACM
- 2020 **Dean's Scholar Award**, University of Iowa
- 2018 **NSF Faculty Early Career Development (CAREER) Award**
- 2018 **Andreas Pfitzmann Best Student Paper Award**, Privacy Enhancing Technologies Symposium
- 2017 **Best Paper Award**, ACM Internet Measurement Conference
- 2015 **NSF CISE Research Initiation Initiative (CRII) Award**
- 2013 **Fitch-Beach Outstanding Graduate Research Award**, Michigan State University
- 2012 **Best Paper Award**, IEEE International Conference on Network Protocols
- 2007, 2008 **Dean's Plaque of Excellence**, National University of Sciences & Technology, Pakistan

Publications

- arXiv **The Inventory is Dark and Full of Misinformation: Understanding the Abuse of Ad Inventory Pooling in the Ad-Tech Supply Chain**
 Yash Vekaria, Rishab Nithyanand, Zubair Shafiq
arXiv:2210.06654, 2022
- arXiv **Your Echoes are Heard: Tracking, Profiling, and Ad Targeting in the Amazon Smart Speaker Ecosystem**
 Umar Iqbal, Pouneh Nikkhah Bahrami, Rahmadi Trimananda, Hao Cui, Alexander Gamero-Garrido, Daniel Dubois, David Choffnes, Athina Markopoulou, Franziska Roesner, Zubair Shafiq
arXiv:2204.10920, 2022
- JOLT **A Scientific Approach to Tech Accountability**
 Woodrow Hartzog, Scott Jordan, David Choffnes, Athina Markopoulou, Zubair Shafiq
Beyond the FTC: The Future of Privacy Enforcement, Harvard Journal of Law & Technology, in press
- PNAS **YouTube, The Great Radicalizer? Auditing and Mitigating Ideological Biases in YouTube Recommendations**
 Muhammad Haroon, Magdalena Wojcieszak, Anshuman Chhabra, Xin Liu, Prasant Mohapatra, Zubair Shafiq
Proceedings of the National Academy of Sciences (PNAS), in press
- PETS **A Utility-Preserving Obfuscation Approach for YouTube Recommendations**
 Jiang Zhang, Hadi Askari, Konstantinos Psounis, Zubair Shafiq
Privacy Enhancing Technologies Symposium, 2023
- PETS **Blocking JavaScript without Breaking the Web**
 Abdul Haddi Amjad, Zubair Shafiq, Muhammad Ali Gulzar
Privacy Enhancing Technologies Symposium, 2023
- CCS **CookieGraph: Measuring and Countering First-Party Tracking Cookies**
 Shaoor Munir, Sandra Siby, Umar Iqbal, Steven Englehardt, Zubair Shafiq, Carmela Troncoso
ACM Conference on Computer and Communications Security, 2023
- S&P **Accuracy-Privacy Trade-off in Deep Ensemble: A Membership Inference Perspective**
 Shahbaz Rezaei, Zubair Shafiq, Xin Liu
IEEE Symposium on Security & Privacy, 2023
- USENIX **AutoFR: Automated Filter Rule Generation for Adblocking**
 Security Hieu Le, Salma Elmalaki, Athina Markopoulou, Zubair Shafiq
USENIX Security Symposium, 2023
- NDSS **Harpo: Learning to Subvert Online Behavioral Advertising**
 Jiang Zhang, Konstantinos Psounis, Muhammad Haroon, Zubair Shafiq
Network and Distributed System Security Symposium, 2022
- USENIX **WebGraph: Capturing Advertising and Tracking Information Flows for Robust Blocking**
 Security Sandra Siby, Umar Iqbal, Steven Englehardt, Zubair Shafiq, Carmela Troncoso
USENIX Security Symposium, 2022
- USENIX **Khaleesi: Breaker of Advertising and Tracking Request Chains**
 Security Umar Iqbal, Charlie Wolfe, Charles Nguyen, Steven Englehardt, Zubair Shafiq
USENIX Security Symposium, 2022

PETS	FP-Radar: Longitudinal Measurement and Early Detection of Browser Fingerprinting Pouneh Nikkhah Bahrami, Umar Iqbal, Zubair Shafiq <i>Privacy Enhancing Technologies Symposium</i> , 2022
ACL	Adversarial Authorship Attribution for Deobfuscation Wanyue Zhai, Jonathan Rusert, Zubair Shafiq, Padmini Srinivasan <i>Association for Computational Linguistics</i> , 2022
ACL	On the Robustness of Offensive Language Classifiers Jonathan Rusert, Zubair Shafiq, Padmini Srinivasan <i>Association for Computational Linguistics</i> , 2022
EuroS&P	DNN Model Architecture Fingerprinting Attack on CPU-GPU Edge Devices Kartik Patwari, Syed Mahbub Hafiz, Han Wang, Houman Homayoun, Zubair Shafiq, Chen-Nee Chuah <i>IEEE European Symposium on Security and Privacy</i> , 2022
DATE	Stealthy Inference Attack on DNN via Cache-based Side-channel Attacks Han Wang, Syed Mahbub Hafiz, Kartik Patwari, Chen-Nee Chuah, Zubair Shafiq, Houman Homayoun <i>IEEE/ACM Design Automation and Test in Europe</i> , 2022
IMC	TrackerSift: Untangling Mixed Tracking and Functional Web Resources Abdul Haddi Amjad, Danial Saleem, Fareed Zaffar, Muhammad Ali Gulzar, Zubair Shafiq <i>ACM Internet Measurement Conference</i> , 2021
S&P	Fingerprinting the Fingerprinters: Learning to Detect Browser Fingerprinting Behaviors Umar Iqbal, Steven Englehardt, Zubair Shafiq <i>IEEE Symposium on Security & Privacy</i> , 2021
NDSS	CV-Inspector: Towards Automating Detection of Adblock Circumvention Hieu Le, Athina Markopoulou, Zubair Shafiq <i>Network and Distributed System Security Symposium</i> , 2021
EACL	Through the Looking Glass: Learning to Attribute Synthetic Text Generated by Language Models Shaoor Munirl, Brishna Batool, Zubair Shafiq, Padmini Srinivasan, Fareed Zaffar <i>European Chapter of the Association for Computational Linguistics</i> , 2021
ACL	A Girl Has A Name: Detecting Authorship Obfuscation Asad Mahmood, Zubair Shafiq, Padmini Srinivasan <i>Annual Conference of the Association for Computational Linguistics</i> , 2020
S&P	AdGraph: A Graph-Based Approach to Ad and Tracker Blocking Umar Iqbal, Peter Snyder, Shitong Zhu, Benjamin Livshits, Zhiyun Qian, Zubair Shafiq <i>IEEE Symposium on Security & Privacy</i> , San Francisco, 2020
PETS	CanaryTrap: Detecting Data Misuse by Third-Party Apps on Online Social Networks Shehroze Farooqi, Maaz Musa, Zubair Shafiq, Fareed Zaffar <i>Privacy Enhancing Technologies Symposium</i> , Montreal, 2020
PETS	Inferring Tracker-Advertiser Relationships in the Online Advertising Ecosystem John Cook, Rishab Nithyanand, Zubair Shafiq <i>Privacy Enhancing Technologies Symposium</i> , Montreal, 2020
PETS	The TV is Smart and Full of Trackers: Measuring Smart TV Advertising and Tracking Janus Varmarken, Hieu Le, Anastasia Shuba, Zubair Shafiq, Athina Markopoulou <i>Privacy Enhancing Technologies Symposium</i> , Montreal, 2020

IoTDI	Characterizing Smart Home IoT Traffic in the Wild M. Hammad Mazhar, Zubair Shafiq <i>ACM/IEEE Conference on Internet of Things Design and Implementation</i> , Sydney, 2020
PAM	FlowTrace: A Framework for Active Bandwidth Measurements using In-band Packet Trains Adnan Ahmed, Ricky Mok, Zubair Shafiq <i>Passive and Active Measurement Conference</i> , Eugene, 2020
PETS	A Girl Has No Name: Automated Authorship Obfuscation using X-Mutant Asad Mahmood, Faizan Ahmad, Zubair Shafiq, Padmini Srinivasan, Fareed Zaffar <i>Privacy Enhancing Technologies Symposium</i> , Stockholm, 2019
PETS	No Place to Hide: Inadvertent Location Privacy Leaks on Twitter Jonathan Rusert, Osama Khalid, Dat Hong, Zubair Shafiq, Padmini Srinivasan <i>Privacy Enhancing Technologies Symposium</i> , Stockholm, 2019
WWW	Measurement and Early Detection of Third-Party Application Abuse on Twitter Shehroze Farooqi, Zubair Shafiq <i>The Web Conference (WWW)</i> , San Francisco, 2019
WWW	ShadowBlock: A Lightweight and Stealthy Adblocking Browser Shitong Zhu, Umar Iqbal, Zhongjie Wang, Zhiyun Qian, Zubair Shafiq, Weiteng Chen <i>The Web Conference (WWW)</i> , San Francisco, 2019
WWW	Measuring Political Personalization of Google News Search Huyen Le, Raven Maragh, Brian Ekdale, Timothy Havens, Andrew High, Zubair Shafiq <i>The Web Conference (WWW)</i> , San Francisco, 2019
ASONAM	A Postmortem of Suspended Twitter Accounts in the 2016 U.S. Presidential Election Huyen Le, Bob Boynton, Zubair Shafiq, Padmini Srinivasan <i>IEEE/ACM International Conference on Advances in Social Networks Analysis and Mining (ASONAM)</i> , Vancouver, 2019
TDSC	Large Scale Characterization of Software Vulnerability Life Cycles Muhammad Shahzad, Zubair Shafiq, Alex X. Liu <i>IEEE Transactions on Dependable and Secure Computing</i> , 2019
PETS	NoMoAds: Effective and Efficient Cross-App Mobile Ad-Blocking Anastasia Shuba, Athina Markopoulou, Zubair Shafiq <i>Privacy Enhancing Technologies Symposium</i> , Barcelona, 2018 Andreas Pfitzmann Best Student Paper Award
NDSS	Measuring and Disrupting Anti-Adblockers Using Differential Execution Analysis Shitong Zhu, Xunchao Hu, Zhiyun Qian, Zubair Shafiq, Heng Yin <i>Network and Distributed System Security Symposium</i> , San Diego, 2018
INFOCOM	Real-time Video Quality of Experience Monitoring for HTTPS and QUIC M. Hammad Mazhar, Zubair Shafiq <i>IEEE International Conference on Computer Communications</i> , Honolulu, 2018
TON	Optimizing Internet Transit Routing for Content Delivery Networks Faraz Ahmed, Zubair Shafiq, Amir Khakpour, Alex Liu <i>IEEE/ACM Transactions on Networking</i> , 2018

- TBD **Optimizing Taxi Driver Profit Efficiency: A Spatial Network-based Markov Decision Process Approach**
 Xun Zhou, Huigui Rong, Chang Yang, Qun Zhang, Amin Vahedian Khezerlou, Hui Zheng, Zubair Shafiq, Alex Liu
IEEE Transactions on Big Data, 2018
- TOPS **Measuring, Characterizing, and Detecting Facebook Like Farms**
 Muhammad Ikram, Lucky Onwuzurike, Shehroze Farooqi, Emiliano De Cristofaro, Arik Friedman, Guillaume Jourjon, Dali Kaafar, Zubair Shafiq
ACM Transactions on Privacy and Security, 2017
- TIST **A Traffic Flow Approach to Early Detection of Gathering Events: Comprehensive Results**
 Amin Khezerlou, Xun Zhou, Lufan Li, Zubair Shafiq, Alex X. Liu, Fan Zhang
ACM Transactions on Intelligent Systems and Technology, 2017
- IMC **Measuring and Mitigating OAuth Access Token Abuse by Collusion Networks**
 Shehroze Farooqi, Fareed Zaffar, Nektarios Leontiadis, Zubair Shafiq
ACM Internet Measurement Conference, London, 2017
Best Paper Award
CACM Research Highlights 2020
- IMC **The Ad Wars: Retrospective Measurement and Analysis of Anti-Adblock Filter Lists**
 Umar Iqbal, Zubair Shafiq, Zhiyun Qian
ACM Internet Measurement Conference, London, 2017
- SIGMETRICS **Characterizing and Modeling Patching Practices of Industrial Control Systems**
 Brandon Wang, Xiaoye Li, Leandro P. de Aguiar, Daniel S. Menasche, Zubair Shafiq
ACM International Conference on Measurement and Modeling of Computer Systems, Urbana-Champaign, 2017
- PETS **Detecting Anti Ad-blockers in the Wild**
 Muhammad Haris Mughees, Zhiyun Qian, Zubair Shafiq
Privacy Enhancing Technologies Symposium, Minneapolis, 2017
- ICDM **Accurate Detection of Automatically Spun Content via Stylometric Analysis**
 Usman Shahid, Shehroze Farooqi, Raza Ahmad, Zubair Shafiq, Padmini Srinivasan, Fareed Zaffar
IEEE International Conference on Data Mining, New Orleans, 2017
- CHI **Revisiting The American Voter on Twitter**
 Huyen Le, G.R. Boynton, Yelena Mejova, Zubair Shafiq, Padmini Srinivasan
ACM Conference on Human Factors in Computing Systems, Denver, 2017
- ICDCS **Distributed Load Balancing in Key-Value Networked Caches**
 Sikder Huq, Zubair Shafiq, Sukumar Ghosh, Amir Khakpour, Harkeerat Bedi
IEEE International Conference on Distributed Computing Systems, Atlanta, 2017
- ICNP **Peering vs. Transit: Performance Comparison of Peering and Transit Interconnections**
 Adnan Ahmed, Zubair Shafiq, Harkeerat Bedi, Amir Khakpour
IEEE International Conference on Network Protocols, Toronto, 2017
- ICNP **Suffering from Buffering? Detecting QoE Impairments in Live Video Streams**
 Adnan Ahmed, Zubair Shafiq, Harkeerat Bedi, Amir Khakpour
IEEE International Conference on Network Protocols, Toronto, 2017

ICNP	Multipath TCP Traffic Diversion Attacks and Countermeasures Ali Munir, Zhiyun Qian, Zubair Shafiq, Alex Liu, Franck Le <i>IEEE International Conference on Network Protocols</i> , Toronto, 2017
ICWSM	Scalable News Slant Measurement Using Twitter Huyen Le, Zubair Shafiq, Padmini Srinivasan <i>AAAI International Conference on Web and Social Media</i> , Denver, 2017
HT	Bumps and Bruises: Mining Presidential Campaign Announcements on Twitter Huyen Le, G.R. Boynton, Yelena Mejova, Zubair Shafiq, Padmini Srinivasan <i>ACM Conference on Hypertext and Social Media</i> , Prague, 2017
Networking	Cascade Size Prediction in Online Social Networks Zubair Shafiq, Alex Liu <i>IFIP Networking</i> , Prague, 2017 Best Paper Award Candidate (3 nominations out of 43 accepted papers)
Networking	A Graph Theoretic Approach to Fast and Accurate Malware Detection Zubair Shafiq, Alex Liu <i>IFIP Networking</i> , Prague, 2017
eCrime	Characterizing Key Stakeholders in an Online Black-Hat Marketplace Shehroze Farooqi, Muhammad Ikram, Emiliano De Cristofaro, Arik Friedman, Guillaume Jourjon, Dali Kaafar, Zubair Shafiq, Fareed Zaffar <i>IEEE/APWG Symposium on Electronic Crime Research</i> , Prague, 2017
ICNP	Optimizing Internet Transit Routing for Content Delivery Networks Faraz Ahmed, Zubair Shafiq, Amir Khakpour, Alex Liu <i>IEEE International Conference on Network Protocols</i> , Singapore, 2016
DSN	Malware Slums: Measurement and Analysis of Malware on Traffic Exchanges Salman Yousaf, Umar Iqbal, Shehroze Farooqi, Raza Ahmad, Zubair Shafiq, Fareed Zaffar <i>IEEE/IFIP International Conference on Dependable Systems and Networks</i> , France, 2016
SIGMETRICS	QoE Analysis of a Large-Scale Live Video Streaming Event Adnan Ahmed, Zubair Shafiq, Amir R. Khakpour <i>ACM International Conference on Measurement and Modeling of Computer Systems</i> , France, 2016
ICDCS	The Internet is For Porn: Measurement and Analysis of Online Adult Traffic Faraz Ahmed, Zubair Shafiq, Alex X. Liu <i>IEEE International Conference on Distributed Computing Systems</i> , Japan, 2016
INFOCOM	Characterizing Caching Workload of a Large Commercial Content Delivery Network Zubair Shafiq, Amir R. Khakpour, Alex X. Liu <i>IEEE International Conference on Computer Communications</i> , San Francisco, 2016
SIGSPATIAL	A Traffic Flow Approach to Early Detection of Gathering Events Xun Zhou, Amin Vahedian Khezerlou, Alex Liu, Zubair Shafiq, Fan Zhang <i>ACM International Conference on Advances in Geographic Information Systems</i> , San Francisco, 2016
CIKM	The Rich and the Poor: A Markov Decision Process Approach to Optimizing Taxi Driver Revenue Efficiency Huigui Rong, Xun Zhou, Chang Yang, Zubair Shafiq, Alex Liu <i>ACM International Conference on Information and Knowledge Management</i> , Indianapolis, 2016

TON	Characterizing and Optimizing Cellular Network Performance during Crowded Events Zubair Shafiq, Lusheng Ji, Alex X. Liu, Jeffrey Pang, Shobha Venkataraman, Jia Wang <i>IEEE/ACM Transactions on Networking</i> , 2016
SMP	What Campaigns Become as Social Media Become the Infrastructure of Political Communication G.R. Boynton, Huyen Le, Yelena Mejova, Zubair Shafiq, Padmini Srinivasan <i>Social Media and Politics</i> , 2016
TMC	Geospatial and Temporal Dynamics of Application Usage in Cellular Data Networks Zubair Shafiq, Lusheng Ji, Alex X. Liu, Jeffrey Pang, Jia Wang <i>IEEE Transactions on Mobile Computing</i> , 2015
NSF/FCC	Tracking Mobile Video QoE in the Encrypted Internet QoE Zubair Shafiq <i>NSF/FCC Workshop on Tracking Quality of Experience in the Internet</i> , Princeton, 2015
NSF/FCC	Bidirectional Crosslayer QoE Optimization QoE Srikanth Sundaresan, Zubair Shafiq <i>NSF/FCC Workshop on Tracking Quality of Experience in the Internet</i> , Princeton, 2015
IMC	Paying for Likes? Understanding Facebook Like Fraud Using HoneyPots Emiliano De Cristofaro, Arik Friedmann, Guillaume Jourjon, Dali Kaafar, Zubair Shafiq <i>ACM Internet Measurement Conference</i> , 2014
SIGMETRICS	Understanding the Impact of Network Dynamics on Mobile Video User Engagement Zubair Shafiq, Jeffrey Erman, Lusheng Ji, Alex X. Liu, Jeffrey Pang, Jia Wang <i>ACM International Conference on Measurement and Modeling of Computer Systems</i> , 2014
SIGMETRICS	Revisiting Caching in Content Delivery Networks Zubair Shafiq, Alex X. Liu, Amir Khakpour <i>ACM International Conference on Measurement and Modeling of Computer Systems</i> , 2014
SIGMETRICS	A First Look at Cellular Network Performance during Crowded Events Zubair Shafiq, Alex X. Liu, Amir Khakpour <i>ACM International Conference on Measurement and Modeling of Computer Systems</i> , 2013
ICNP	Who are You Talking to? Breaching Privacy in Encrypted IM Networks Muhammad U. Ilyas, Zubair Shafiq, Alex X. Liu, Hayder Radha <i>IEEE International Conference on Network Protocols</i> , 2013
CSCW	Is News Sharing on Twitter Ideologically Biased? Jonathan Morgan, Cliff Lampe, Zubair Shafiq <i>ACM Conference on Computer Supported Cooperative Work and Social Computing</i> , 2013
ACM HotNets	Cross-Path Inference Attacks on Multipath TCP Zubair Shafiq, Franck Le, Mudhakar Srivatsa, Alex X. Liu <i>ACM Workshop on Hot Topics in Networks</i> , 2013
TON	Large Scale Measurement and Characterization of Cellular Machine-to-Machine Traffic Zubair Shafiq, Lusheng Ji, Alex X. Liu, Jeffrey Pang, Jia Wang <i>IEEE/ACM Transactions on Networking</i> , 2013
JSAC	Identifying Leaders and Followers in Online Social Networks Zubair Shafiq, Muhammad U. Ilyas, Alex X. Liu, Hayder Radha <i>IEEE Journal on Selected Areas in Communications</i> , 2013
JSAC	A Distributed Algorithm for Identifying Information Hubs in Social Networks Muhammad U. Ilyas, Zubair Shafiq, Alex X. Liu, Hayder Radha <i>IEEE Journal on Selected Areas in Communications</i> , 2013

- JNSM **TCAMChecker: A Software Approach to the Error Detection and Correction of TCAM-based Networking Systems**
 Zubair Shafiq, Chad Meiners, Alex Liu, Ke Shen, Zheng Qin
Springer Journal of Network and Systems Management, 2012
- ICNP **A Semantics Aware Approach to Automated Reverse Engineering Unknown Protocols**
 Yipeng Wang, Xiaochun Yun, Zubair Shafiq, Alex X. Liu, Zhibin Zhang, Liyan Wang, Danfeng (Daphne) Yao, Yongzheng Zhang, Li Guo
IEEE International Conference on Network Protocols, 2012
Best Paper Award
- SIGMETRICS **A First Look at Cellular Machine-to-Machine Traffic – Large Scale Measurement and Characterization**
 Zubair Shafiq, Lusheng Ji, Alex X. Liu, Jeffrey Pang, Jia Wang
ACM International Conference on Measurement and Modeling of Computer Systems, London, 2012
- ICSE **A Large Scale Exploratory Analysis of Software Vulnerability Life Cycles**
 Muhammad Shahzad, Zubair Shafiq, Alex X. Liu
International Conference on Software Engineering, Switzerland, 2012
- INFOCOM **Characterizing Geospatial Dynamics of Application Usage in a 3G Cellular Data Network**
 Zubair Shafiq, Lusheng Ji, Alex X. Liu, Jeffrey Pang, Jia Wang
IEEE Conference on Computer Communications, Orlando, 2012
- SIGMETRICS **Characterizing and Modeling Internet Traffic Dynamics of Cellular Devices**
 Zubair Shafiq, Lusheng Ji, Alex X. Liu, Jia Wang
ACM International Conference on Measurement and Modeling of Computer Systems, San Jose, 2011
- Networking **A Random Walk Approach to Modeling the Dynamics of the Blogosphere**
 Zubair Shafiq, Alex X. Liu
IFIP Networking, Spain, 2011
- INFOCOM **A Distributed and Privacy-Preserving Algorithm for Identifying Information Hubs in Social Networks**
 Muhammad U. Ilyas, Zubair Shafiq, Alex X. Liu, Hayder Radha
IEEE Conference on Computer Communications, Spain, 2011
- RAID **PE-Miner: Mining Structural Information to Detect Malicious Executables in Realtime**
 Zubair Shafiq, Syeda Momina Tabish, Fauzan Mirza, Muddassar Farooq
International Symposium On Recent Advances In Intrusion Detection, France, 2009
- GECCO **Evolvable Malware**
 Sadia Noreen, Shafaq Murtaza, Zubair Shafiq, Muddassar Farooq
ACM Genetic and Evolutionary Computation Conference, Canada, 2009
- CCS AISeC **Using Spatio-Temporal Information in API Calls with Machine Learning Algorithms for Malware Detection and Analysis**
 Faraz Ahmed, Haider Hameed, Zubair Shafiq, Muddassar Farooq
Workshop on Security and Artificial Intelligence, ACM Conference on Computer & Communications Security, Chicago, 2009
- KDD CSI **Malware Detection using Statistical Analysis of Byte-Level File Content**
 Syeda Momina Tabish, Zubair Shafiq, Muddassar Farooq
Workshop on CyberSecurity and Intelligence Informatics (CSI), ACM Conference on Knowledge Discovery and Data Mining, France, 2009

VB	PE-Probe: leveraging packer detection and structural information to detect malicious portable executables Zubair Shafiq, Syeda Momina Tabish, Muddassar Farooq <i>Virus Bulletin</i> , Switzerland, 2009
Elsevier	Fuzzy Case Based Reasoning for Facial Expression Recognition Aasia Khanum, Muid Mufti, M. Y. Javed, Zubair Shafiq <i>Elsevier Fuzzy Sets and Systems</i> , 2009
EvoComNet	A Comparative Study of Fuzzy Inference Systems, Neural Networks and Adaptive Neuro Fuzzy Inference Systems for Portscan Detection Zubair Shafiq, Muddassar Farooq, Syed Ali Khayam <i>Applications of Evolutionary Computing</i> , EvoComNet, Italy, 2008
DIMVA	Embedded Malware Detection using Markov n-grams Zubair Shafiq, Syed Ali Khayam, Muddassar Farooq <i>International Conference on Detection of Intrusions, Malware and Vulnerability Assessment</i> , France, 2008
GECCO	Improving Accuracy of Immune Inspired Malware Detectors using Intelligent Features Zubair Shafiq, Syed Ali Khayam, Muddassar Farooq <i>ACM Genetic and Evolutionary Computation Conference</i> , Atlanta, 2008

Funding

External Competitive Research Grants

UC	Auditing Compliance of Data Privacy Laws in California UC Partnerships in Computational Transformation PI, Duration: 2022-2023, Total: \$160,000, Share: \$80,000 Personnel: Zubair Shafiq (PI: UC Davis); Athina Markopoulou (PI: UC Irvine); Gene Tsudik (Co-PI: UC Irvine)
NSF-SaTC	Defending against Emerging Stateless Web Tracking National Science Foundation PI, Duration: 2022-2026, Total: \$1,200,000, Share: \$400,000 Personnel: Zubair Shafiq (PI: UC Davis); Alexandros Kapravelos (PI: NC State); Anupam Das (Co-PI: NC State)
CITRIS and the Banatao Institute	Auditing the compliance of California consumer privacy regulations at scale Center for Information Technology Research in the Interest of Society (CITRIS) Co-PI, Duration: 2021-2022, Total: \$60,000, Share: \$20,000 Personnel: Serge Egelman (Co-PI: UC Berkeley); Zubair Shafiq (Co-PI: UC Davis)
NSF-SaTC-Frontier	Protecting Personal Data Flow on the Internet National Science Foundation PI, Duration: 2020-2025, Total: \$10,000,000, Share: \$1,100,000 Personnel: Zubair Shafiq (PI: UC Davis); Athina Markopoulou (PI: UC Irvine); Konstantinos Psounis (PI: USC); David Choffnes (PI: Northeastern)
NSF-CAREER	Quality of Experience and Network Management in the Encrypted Internet National Science Foundation PI, Duration: 2018-2023, Total: \$500,000, Share: \$500,000 Personnel: Zubair Shafiq (PI: UC Davis)

NSF-SaTC	A Multi-Layer Learning Approach to Mobile Traffic Filtering National Science Foundation PI, Duration: 2018-2021, Total: \$500,000, Share: \$250,000 Personnel: Zubair Shafiq (PI: UC Davis); Athina Markopoulou (PI: UC Irvine)
NSF-SaTC	The Web Ad Technology Arms Race: Measurement, Analysis, and Countermeasures National Science Foundation PI, Duration: 2017-2020, Total: \$500,000 + \$16,000 (REU Supplement 2019) + \$16,000 (REU Supplement 2021), Share: \$282,000 Personnel: Zubair Shafiq (PI: UC Davis); Zhiyun Qian (PI: UC Riverside)
NSF-NeTS	Towards Scalable and Energy Efficient Cellular IoT Communication National Science Foundation PI, Duration: 2016-2019, Total: \$500,000, Share: \$166,000 Personnel: Zubair Shafiq (PI: Iowa); K.K. Ramakrishnan (PI: UC Riverside); Koushik Kar (PI: RPI)
NSF-SaTC	Multipath TCP Side Channel Vulnerabilities and Defenses National Science Foundation PI, Duration: 2015-2018, Total: \$500,000, Share: \$167,000 Personnel: Zubair Shafiq (PI: Iowa); Zhiyun Qian (PI: UC Riverside); Alex Liu (PI: Michigan State University)
NSF-NeTS	Towards Measurement and Optimization of Internet Video Quality of Experience National Science Foundation PI, Duration: 2015-2018, Total: \$175,000 + \$16,000 (REU Supplement 2016), Share: \$191,000 Personnel: Zubair Shafiq (PI: Iowa)
DTL	Detection and Circumvention of Ad-Block Detectors Data Transparency Lab PI, Duration: 2016-2017, Total: \$56,000, Share: \$28,000 Personnel: Zubair Shafiq (PI: Iowa); Zhiyun Qian (PI: UC Riverside)
	Internal Competitive Research Grants
Academic Senate	Socio-Computational Interventions to Mitigate Misinformation in Recommendations Noyce Foundation PI, Duration: 2022-2023, Total: \$25,000 Personnel: Magdalena Wojcieszak (PI), Zubair Shafiq (Co-PI)
Noyce	Measuring and Mitigating Biases in Social Recommendation Algorithms Noyce Foundation PI, Duration: 2022-2023, Total: \$236,000 Personnel: Zubair Shafiq (PI), Magdalena Wojcieszak (Co-PI)
Noyce	Cross-Layer Approach to Enhance Security/Privacy of AI-enabled IoT Eco-Systems Noyce Foundation Co-PI, Duration: 2022-2023, Total: \$225,000 Personnel: Chen-Nee Chuah (PI), Zubair Shafiq (Co-PI), Houman Homayoun (Co-PI)
Noyce	Measuring and Mitigating Biases in Social Recommendation Algorithms Noyce Foundation PI, Duration: 2021-2022, Total: \$235,690 Personnel: Zubair Shafiq (PI), Xin Liu (Co-PI), Magdalena Wojcieszak (Co-PI)

Noyce	Cross-Layer Approach to Enhance Security/Privacy of AI-enabled IoT Eco-Systems Noyce Foundation Co-PI, Duration: 2021-2022, Total: \$225,000 Personnel: Chen-Nee Chuah (PI), Zubair Shafiq (Co-PI), Houman Homayoun (Co-PI)
UIRF	Social Media Powered Real-Time Digital News Recommendation University of Iowa Research Foundation PI, Duration: 2015-2016, Total: \$75,000 Personnel: Zubair Shafiq (PI)
Obermann	Heterogeneous Network Data Analytics to Improve Urban Sustainability Obermann Center Interdisciplinary Research Grant PI, Duration: 2015-2016, Total: \$12,000 Personnel: Xun Zhou (PI); Zubair Shafiq (Co-PI)
	Industry Grants and Unrestricted Gifts
Siemens	PI, Duration: 2021, Total: \$60,000, Share: \$60,000 Personnel: Zubair Shafiq (PI: UC Davis)
Siemens	PI, Duration: 2019, Total: \$30,000, Share: \$30,000 Personnel: Zubair Shafiq (PI: Iowa)
Siemens	PI, Duration: 2018, Total: \$60,000, Share: \$60,000 Personnel: Zubair Shafiq (PI: Iowa)
Verizon	PI, Duration: 2018, Total: \$20,000, Share: \$20,000 Personnel: Zubair Shafiq (PI: Iowa)
Minim	PI, Duration: 2018, Total: \$66,164, Share: \$66,164 Personnel: Zubair Shafiq (PI: Iowa)
Siemens	PI, Duration: 2017, Total: \$30,000, Share: \$30,000 Personnel: Zubair Shafiq (PI: Iowa)
Nokia	PI, Duration: 2017, Total: \$53,200, Share: \$53,200 Personnel: Zubair Shafiq (PI: Iowa)
Futurewei	PI, Duration: 2017, Total: \$100,384, Share: \$100,384 Personnel: Zubair Shafiq (PI: Iowa)
Facebook	PI, Duration: 2016, Total: \$8,400, Share: \$8,400 Personnel: Zubair Shafiq (PI: Iowa)

Teaching

FYS	Big Data, Big Brother Winter 2023, University of California at Davis
ECS 289M	Network Security & Privacy Winter 2023, University of California at Davis
ECS 152A	Computer Networks Fall 2022, University of California at Davis
ECS 152A	Computer Networks Spring 2022, University of California at Davis
ECS 153	Computer Security Winter 2022, University of California at Davis

- ECS 289M **Data-Driven Security**
Spring 2021, University of California at Davis
- ECS 152B **Computer Networks**
Winter 2021, University of California at Davis
- CS 2620 **Networking & Security for Informatics**
Spring 2020, The University of Iowa
- CS 4980 **Online Advertising & Tracking**
Fall 2019, The University of Iowa
- CS 2620 **Networking & Security for Informatics**
Spring 2019, The University of Iowa
- CS 4980 **Internet Measurement**
Fall 2018, The University of Iowa
- CS 2620 **Networking & Security for Informatics**
Spring 2018, The University of Iowa
- CS 2620 **Networking & Security for Informatics**
Spring 2017, The University of Iowa
- CS 4980 **Network Security and Privacy**
Fall 2016, The University of Iowa
- CS 2620 **Networking & Security for Informatics**
Spring 2016, The University of Iowa
- CS 4980 **Advanced Computer Networks**
Fall 2015, The University of Iowa
- CS 2620 **Networking & Security for Informatics**
Spring 2015, The University of Iowa
- CS 4980 **Internet Measurement**
Fall 2014, The University of Iowa

Students

Doctorate

- 2022-current Rajvardhan Oak
- 2021-current Muhammad Haroon
- 2021-current Pouneh Nikkhah Bahrami
- 2021-current Shaoor Munir
- 2021-current Yash Vekaria
- 2021-current Rong-Ching (Anna) Chang
- 2021-current Hadi Askari
- 2016-2021 Dr. Umar Iqbal; First Position: CIFellow/Postdoc, University of Washington
- 2015-2021 Dr. Shehroze Farooqi; First Position: Researcher, Palo Alto Networks
- 2015-2019 Dr. Huyen Le; First Position: Postdoc, National Center for Toxicological Research

Select Recent Masters Mentees

- 2021 Mohammad Ismail Daud
- 2021 Sunshine Chong

2021 Rachit Dhamija
2020 Pouneh Nikkhah Bahrami

Select Recent Undergraduate Mentees

2022- Jake Smith
2022- Christina Phan
2022- Kev Rockwell
2020-2022 Kajal Patel (NSF REU)
2020-2022 Wanyue Zhai (graduate student at Stanford)
2020-2022 Ray Ngan (NSF REU) (industry: Palo Alto Networks)
2020-2021 Surya Konkimalla
2020-2021 Charles Nguyen (industry: Apple)
2019-2021 Charlie Wolfe (NSF REU) (industry: Apple)
2021 Caelan MacArthur (NSF DREU)
2020-2021 Taimur Kashif (NSF REU) (industry: VMWare)
2019-2020 Ashton Woiwood (NSF REU)

High School

2019 Kathy Zhong (SSTP)
2018 Alice Martynova (SSTP)
2017 William Kim (SSTP)
2016 Brandon Wang (SSTP)

External Service

Conference TPC/Reviewer	IEEE S&P (2022), PETS (2021, 2020, 2019, 2018, 2017), ACM IMC (2021, 2020), ACM CoNEXT (2019), ACM SIGMETRICS (2023, 2022, 2020, 2013), WWW (2020, 2018), ACM CSCW (2018, 2019), IEEE/IFIP TMA (2020, 2019), NDSS MADWeb Workshop (2019), IEEE INFOCOM (2017, 2015, 2010, 2009), ACM WPES (2018), IEEE S&P Consumer Protection Workshop (2021, 2020), ACM SIGCOMM Internet-QoE Workshop (2017), ACM SIGCOMM Workshop on IoT Security and Privacy (2018), WWW CyberSafety Workshop (2018), WWW Workshop on Location and the Web (2018), IEEE ICNP (2014, 2013), MASCOTS (2013), ICDCN (2017, 2018)
Journal Reviewer	IEEE/ACM Transactions on Networking, ACM Transactions on the Web, IEEE Transactions on Mobile Computing, IEEE Transactions on Network and Service Management, ACM Transactions on Multimedia Computing, IEEE Transactions on Cognitive Communications and Networking, ACM SIGCOMM Computer Communication Review, Elsevier Computer Communications, Elsevier Performance Evaluation, Springer Wireless Networks
PC Co-Chair	Privacy Enhancing Technologies Symposium (PETs), 2024
PC Co-Chair	Workshop on Technology and Consumer Protection (ConPro'23), IEEE Symposium on Security & Privacy ("Oakland")
PC Co-Chair	Workshop on Technology and Consumer Protection (ConPro'22), IEEE Symposium on Security & Privacy ("Oakland")
PC Co-Chair	Workshop on Measurements, Attacks, and Defenses for the Web (MADWeb'23), Network and Distributed System Security Symposium (NDSS)

PC Co-Chair	Workshop on Measurements, Attacks, and Defenses for the Web (MADWeb'22), Network and Distributed System Security Symposium (NDSS)
Publicity Co-Chair	ACM International Conference on emerging Networking EXperiments and Technologies (CoNEXT 2020)
Co-Chair	NSF NeTS Early Career Investigators Workshop 2019
PC Co-Chair	Student Workshop - ACM International Conference on emerging Networking EXperiments and Technologies (CoNEXT 2018)
PC Co-Chair	WWW 8th International Workshop on Location and the Web (LocWeb 2018)
Poster Chair	ACM/IEEE Symposium on Architectures for Networking and Communications Systems (ANCS 2018)
Technical Committee	Elsevier Computer Communications (2015-2019)
Guest Editor	Special Issue on Mobile Traffic Analytics, Elsevier Computer Communications (2016)
Editorial Board	Proceedings on Privacy Enhancing Technologies (PoPETs) (2019, 2020, 2021)
Panelist	NSF (2017, 2018, 2019, 2020, 2021, 2022)

Internal Service

Chair	Departmental Colloquium Series Department of Computer Science, University of California Davis, 2021-2023
Member	Diversity, Equity, Inclusion Committee College of Engineering, University of California Davis, 2021-2022
Committee	Departmental Graduate Committee Department of Computer Science, University of Iowa, 2019-2020
Chair	Departmental Colloquium Series Department of Computer Science, University of Iowa, 2019-2020
Member	Executive Committee, Iowa Initiative for Artificial Intelligence (IIAI) The University of Iowa, 2019-2020
Member	Department Executive Committee Department of Computer Science, The University of Iowa, 2016-2019
Member	Faculty Recruitment Committee Department of Computer Science, The University of Iowa, 2015-2020
Mentor	Black Girls Do Science College of Engineering, The University of Iowa, 2015-2016
Mentor	Iowa Edge Classroom Experience Center for Diversity and Enrichment, The University of Iowa, 2015-2018
Mentor	Summer Research Opportunities Program (SROP) Graduate College, The University of Iowa, 2017
Mentor	Secondary Student Training Program (SSTP) Belin-Blank Center, The University of Iowa, 2016-2019

Patents

USPTO Jia Wang, Lusheng Ji, Alex X. Liu, Zubair Shafiq. Optimization of cellular network architecture based on device type-specific traffic dynamics. November 2019
10484881

USPTO Jia Wang, Lusheng Ji, Alex X. Liu, Jeffrey Pang, Zubair Shafiq. Cellular Connection Sharing.
10420167 September 2019

Expert Testimony & Reports

4:20-cv-05146 **Calhoun v. Google LLC** U.S. District Court for the Northern District of California; Plaintiffs Expert for Bleichmar Fonti & Auld LLP, Simmons Hanly Conroy LLC, DiCello Levitt Gutzler LLP

4:21-cv-02155 **In re Google RTB Consumer Privacy Litigation** U.S. District Court for the Northern District of California; Plaintiffs Expert for Pritzker Levine LLP, Bleichmar Fonti & Auld LLP, Simmons Hanly Conroy LLC, DiCello Levitt Gutzler LLP, Bottini & Bottini Inc., Cotchett, Pitre & McCarthy, LLP.